

Beyond Notebooks: Interactive Data visualization with dashboards

Nico Kreiling

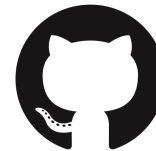
Hi, I'm Nico Kreiling



- Data Scientist @ Scieneers
- Host of the [Techtiefen](#) podcast
- Major focus fields:
 - Natural Language Processing (NLP)
 - Recommender Systems (RecSys)
 - Machine Learning Operations (MLOps)



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[Conference Talk Archive](#)

Agenda

- 🙌 Notebooks 😈
- Use Cases for Dashboards
- Framework Comparison
 - Streamlit
 - Panel
 - Voila
- Summary

😊 Notebooks 😈


Notebooks for science



I love Notebooks. They make it so simple to quickly try new things!

Notebooks are not for reproducibility but flexibility! Think of notebooks like a more structured iPython shell

You can use the `ipython %history-magic!`




Notebooks are terrible. The execution order is always messy, which makes code really badly reproducible.

But in a iPython all commands are kept in sequence

I don't believe in magic!

Notebooks for software engineering



Notebooks aren't there
to write complex code

Still: Notebooks aren't
there to write complex
code, such as class
structures

Notebooks don't have
valuable features such as
linting, type-checking and
auto-completion

Notebooks are not
even properly usable
in version control



Notebooks for learning and exploration

Notebooks are great for learning!

But it gives users the possibility to play with data and change them interactively!

You can also write bad code in an editor!

Absolutely not! They have lot's of hidden information, which makes it very hard to create good code!

But notebooks encourage bad programming practices!

Guys - what about dashboards?



Notebooks / Dashboards Pro's and Con's

	Notebooks are great at...	Notebooks fail...
Dashboards +	<p>Combining data with general information (markdown)</p> <p>Data visualizations</p> <p>Data exploration</p>	<p>To ensure reproducibility</p> <p>Providing a restricted access to data</p> <p>For non-technical users</p>
Dashboards -	<p>As interactive computing environment</p> <p>teaching to code</p>	<p>For proper software engineering</p>

Usecases for Dashboards

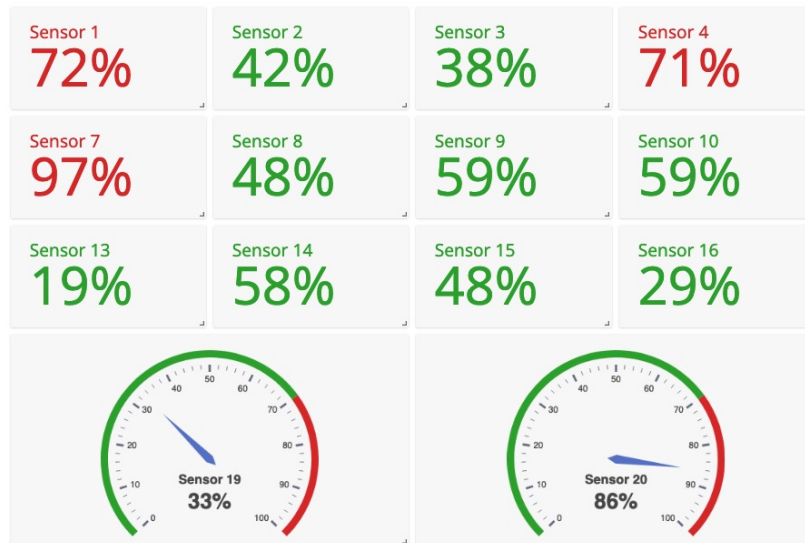
What is a Dashboard?

A **dashboard** is a type of graphical user interface which often provides **at-a-glance views of key performance indicators** (KPIs) relevant to a particular objective or business process.

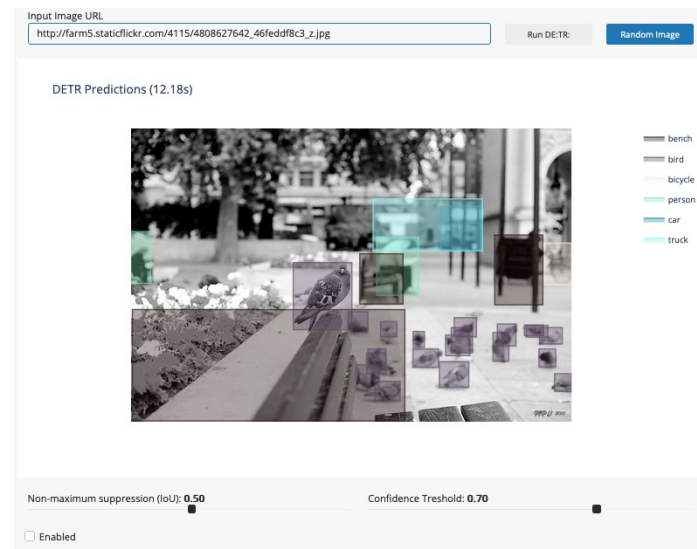
In other usage, "dashboard" is another name for "progress report" or "report" and considered a form of **data visualization**. In providing this **overview**, business owners can **save time and improve their decision making** by utilizing dashboards.



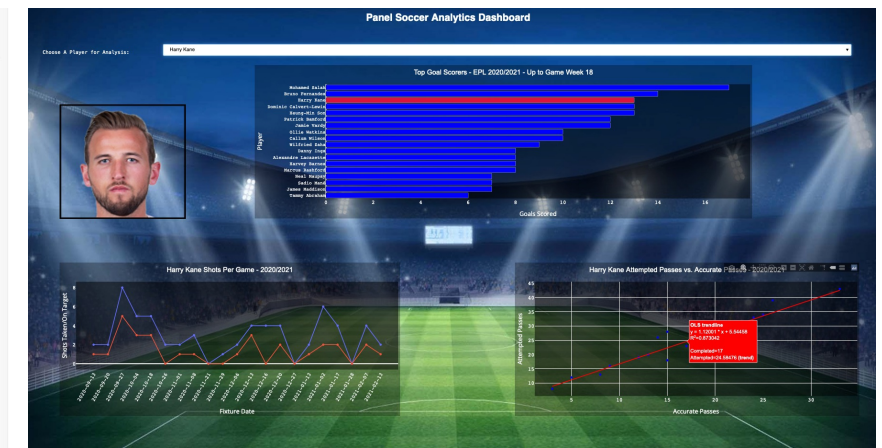
Use Cases for Dashboards



Monitoring Streaming Data

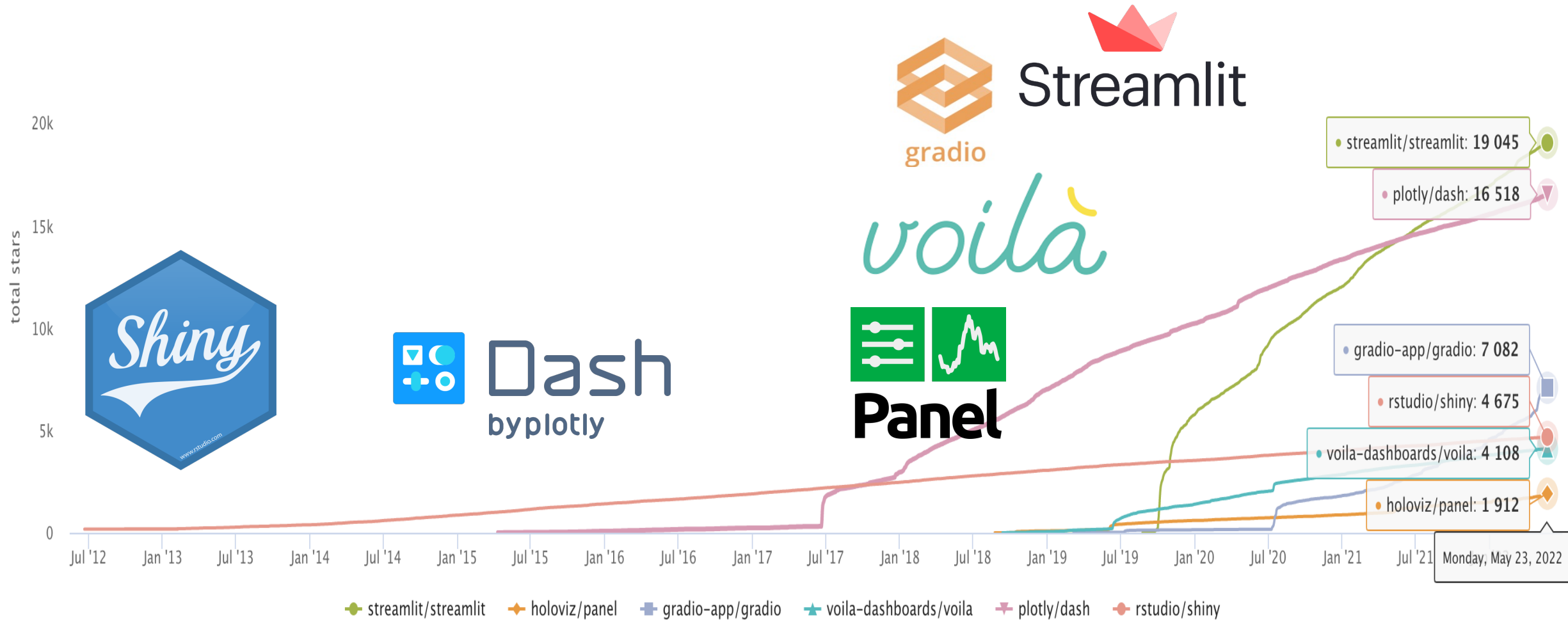


Interactive (ML) Demos


























Analytical Dashboards

What dashboards to exist



Which dashboard tools are out there?

Name	Stars	Contributors	Downloads		License	Sponsors	Built on	
bokeh	 16k	 393	pypi	3M/month	conda	541k/month	BSD-3-Clause	NUMFOCUS  ANACONDA.  bokeh
dash	 17k	 98	pypi	862k/month	conda	26k/month	MIT	 plotly  plotly
streamlit	 19k	 129	pypi	1M/month	conda	6k/month	Apache 2	 Streamlit -
panel	 1.9k	 93	pypi	464k/month	conda	63k/month	BSD	 ANACONDA.  bokeh
gradio	 7k	 60	pypi	265k/month	conda	0/month	Apache License 2.0	 Hugging Face -
visdom	 9.1k	 94	pypi	64k/month	conda	1k/month	CC-BY-NC-4.0	-  plotly
voila	 4.1k	 55	pypi	39k/month	conda	5k/month	BSD	QuantStack -

Source: <https://pyviz.org/tools#dashboarding>

voilà

Voila

- Open Source library to transform any Jupyter notebook into a dashboard
- Also works for some non-python kernels
- Mostly used together with Jupyter widgets
- Minimal learning curve
- Sponsored by QuantStack

Voila Workflow

- Create a notebook using [ipython-widgets](#)
- Convert the notebook into a dashboard using
`voila notebook.ipynb`



Streamlit

Streamlit

Many examples at [Awesome streamlit](#)

- Python library (open source)
- But also a start-up which was [aquired by snowflake](#) recently
- Easy to use with enhanced caching and storage options
- Provides an own cloud for deployment

Streamlit workflow

- Create a dashboard.py file and `import streamlit as st`
- Use streamlit components for inputs and outputs
- Use `streamlit run dashboard.py`



Panel

Panel

Many examples at [Awesome panel](#)

- Python library on top of [param](#)
- Allows usage within a notebook
- Provides multiple APIs
 - Interact: automatically create UI controls by using type inference
 - Widgets, Templates & Pipelines: Fine grained control to build complicated dashboards
- Part of a bigger eco-system, fully sponsored by Anaconda

HoloViz-maintained libraries



Panel Workflow

- Use-case 1: Easy Notebook usage
 - Call `pn.extension()`
 - Use `pn.interact` to transform any function into a minimal dashboard
 - Use `pn.serve()` to start a full-screen dashboard
- Use-case 2: Create a production dashboard
 - Create a file such as `dashboard.py` and import panel
 - Create a class that inherits from `param.Parameterized`
 - Instantiate that class
 - Run `panel serve app.py`

Comparison & Summary

Comparison

	Voila	Streamlit	Panel
Programming Languages	Python, C++, Julia	Python	Python
Notebook Support	Yes	No	Yes
Design flexiablity	Templating system, but not the main focus	Limited but easy theme editor	Powerfull Templating system using Bootstrap / Material-Design
Deployment	Documentation for multiple providers (GCP, Binder, Heroku..)	Streamlit cloud	Documentation for multiple providers (Azure, GCP, Binder, Anaconda, Herokus..)
Community + Support	Popular, but bit less active	Very popular and active	Small, very personal community
Strength	Multi-Language Support Tight Jupyter Coupling	Ease-of-use Beautiful by default	Very flexibel Multi-Page-Support

More information

- Read: A [detailed comparison](#) of Voila, Streamlit, Panel and Dash
- Video [PyData Workshop](#) with the authors of those Dash, Voila, Panel and Streamlit
- Code can be found at: <https://github.com/krlng/py-dashboarding/tree/main/training>
- Or reach out to me:



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